# High quality monitoring of water systems using in situ automatic measurement stations that incorporate real-time data quality analysis tools

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#### Overview

- ➤ Brief Introduction to Primodal/ULaval
- ➤ RSM30 Monitoring Stations/Networks
- ➤ Real-Time Data Quality Evaluation
- > Discussion for the Future



# Introducing Primodal / U Laval

- > Expertise
  - Process Engineering, Design, Control, Modelling, Monitoring and Data Analysis
    - COMMON THEME → Data Evaluation
      - the need for accurate and representative data



# Introducing Primodal / U Laval

- ➤ Primodal Inc. / Primodal Systems Inc.
  - Offices in Hamilton, ON.; Quebec, QC; Kalamazoo, MI
  - PI: Water/Wastewater Consulting Firm
  - PSI: Monitoring Equipment
- > modelEAU / Université Laval
  - Based in Quebec, QC.
  - Water and Modeling-based Research Group

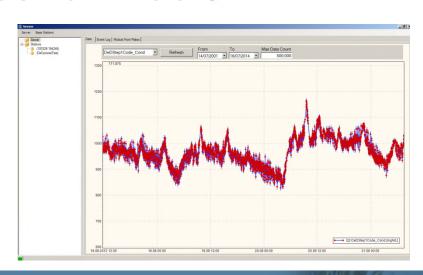


# Primodal / U Laval Cooperation

- > Platform
  - RSM30<sup>™</sup> monitoring station
  - Portable and sensor independent



- ➤ Advanced Data Evaluation Tools
  - PrecisionNow<sup>©</sup>
  - Real-time data evaluation methods and data validation algorithms

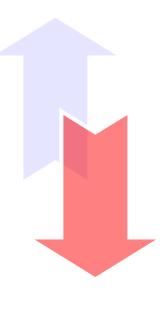




# Monitoring for Process Understanding

#### > The Potential

- Tracking Impacts
- Limitless applications for study
- Whole-system modelling
- Decision-making



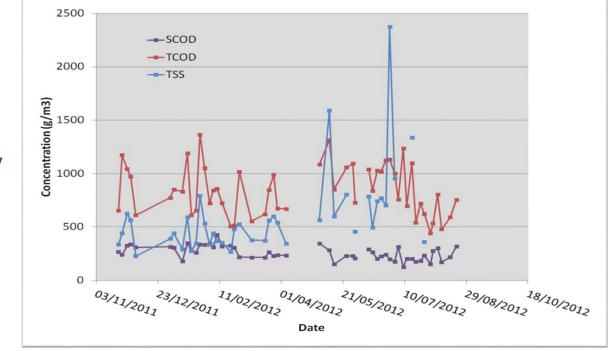
#### > The Pitfalls

- Data Accuracy
  - system behavior
- Data Graveyards
- Communication
- Data Expertise
- Data Maintenance
- Data Quality



# > Typical Data

- Grab samples
- 1-yr time period
- Variations
  - Time of Day
  - Season
  - Weather
  - Location

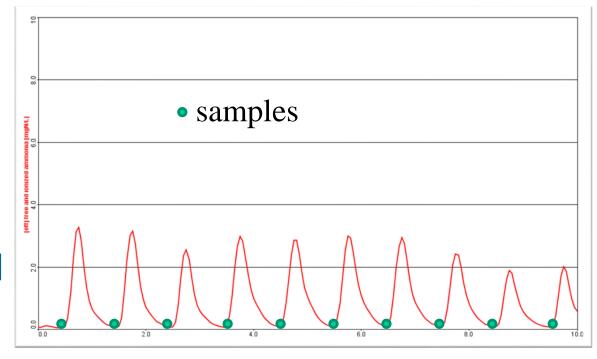






# ➤ Grab Sample Issues

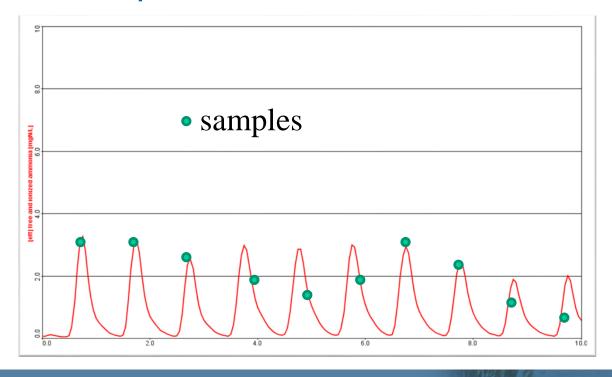
- Behavior missed
- Trends missed
- Events missed
- Average case missed





# ➤ Grab Sample Issues

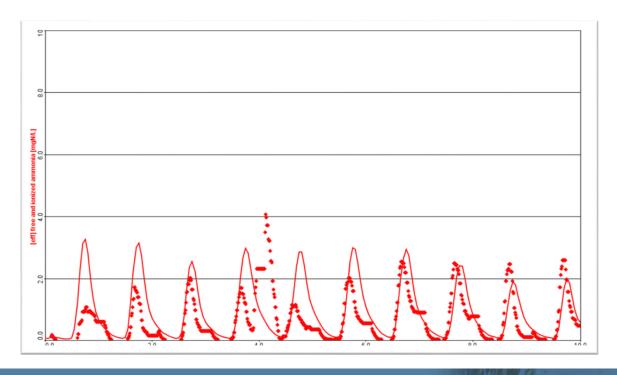
- Concentrations unrepresentative
- Trends incorrect
- Impacts incorrectly inferred





# ➤ High Frequency Monitoring

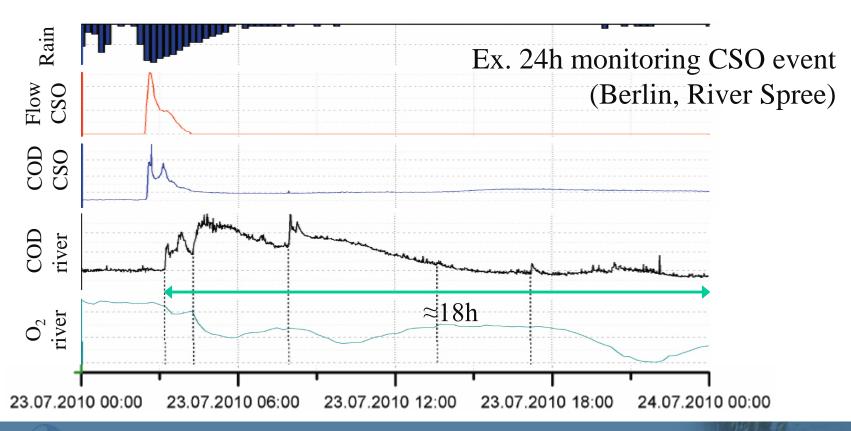
- Essentially continuous
- Trends
- Event detection





#### **Problem Definition**

# Need for advanced data quality evaluation





### **Problem Definition**

Need for advanced data quality evaluation

**Effective management of water systems** 

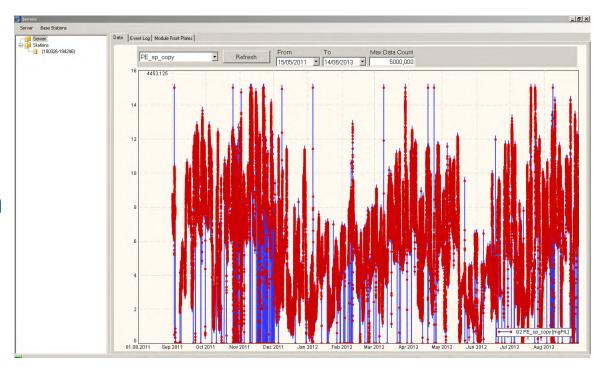
Monitoring and assessment strategy

Reliable water quality information

Modelling, forecasting, control...

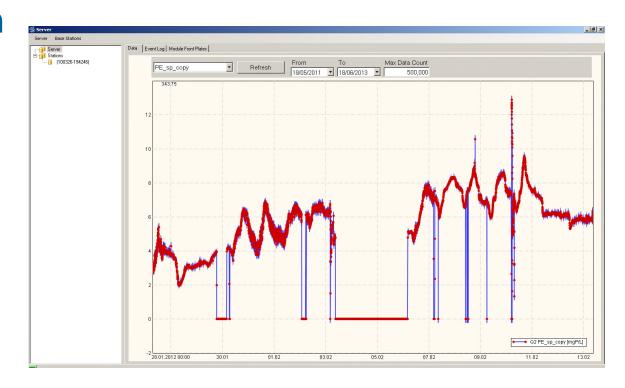


- Outliers
- Sensor Faults
  - Noise
  - Malfunction
  - Calibration



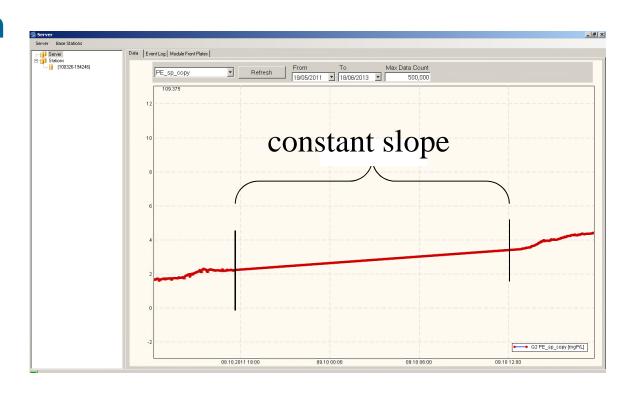


- Malfunction
  - zero



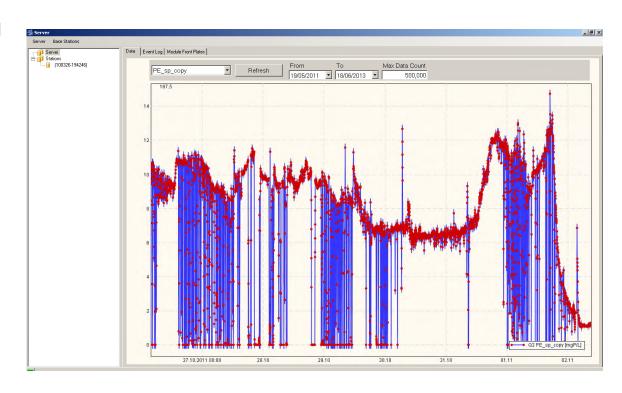


- Malfunction
  - OddBehaviour



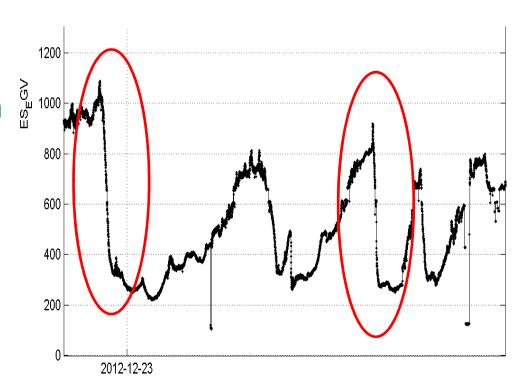


- Malfunction
  - Noise





- More complicated
  - Detecting the difference between real events and problems



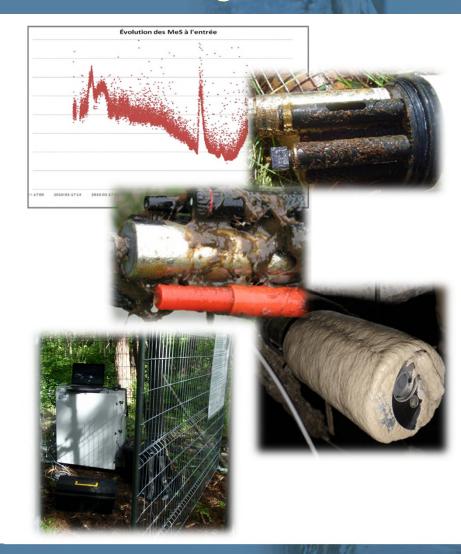


# Identified Needs In Water Monitoring

#### > Identified Issues:

- complex data graveyards too common
- too much post-processing effort
- data from faulty sensors too common

<u>Challenge:</u>
Automated Data Validation





#### Methods for Data Validation

PrecisionNow Practical Implementation

Typical Typical Water Sector

One-step calcs.
Cross-correlations
Manual Procedures
Multi-sample ave.

Real-time automated data validation



# Classic Methods for Data Validation

# ➤ Single data validation: **one-step**

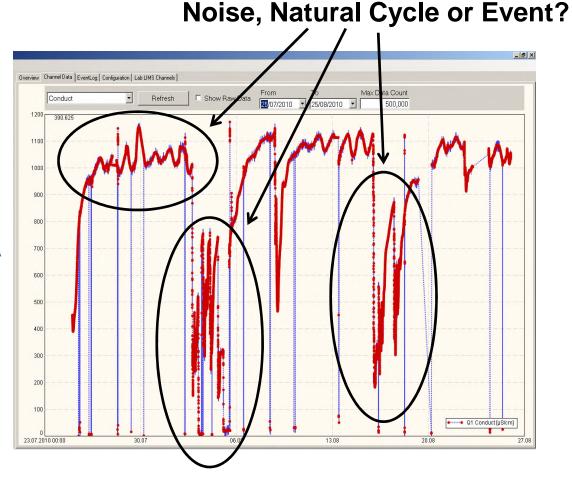
Method	Description
Manual evaluation	Comparison with grab samples
Constant value (TCV)	Constant value in allowed period
Range	[min, max] allowed values
Rate of change	[min, max] allowed rate of change over time
Running variance	[min, max] allowed StD



#### Univariate

Data from Quebec City: St Charles River

Conductivity raw data

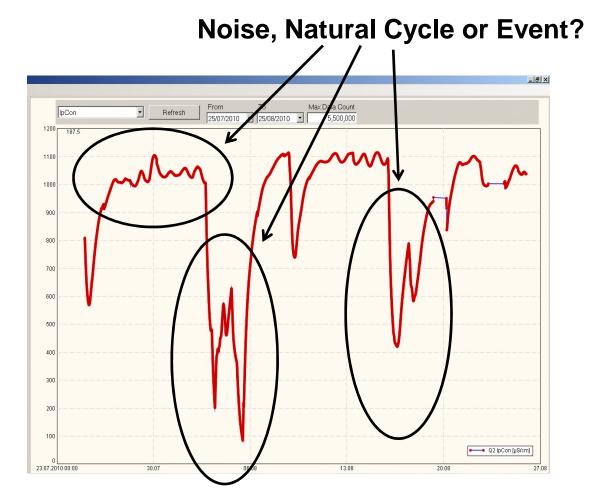




# Univariate

Data from Quebec City: St Charles River

> Outlier detection followed by a LowPass Filter



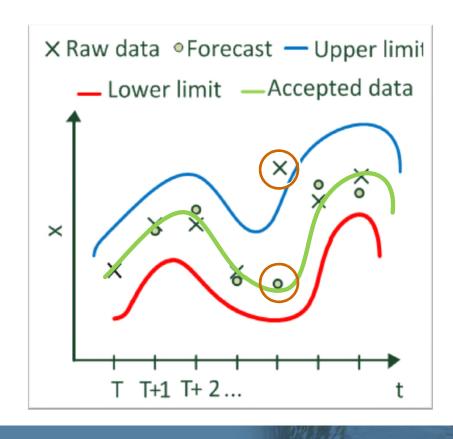


# Model-Based Method for Outlier Detection

- > Univariate time series analysis
  - Outlier detection

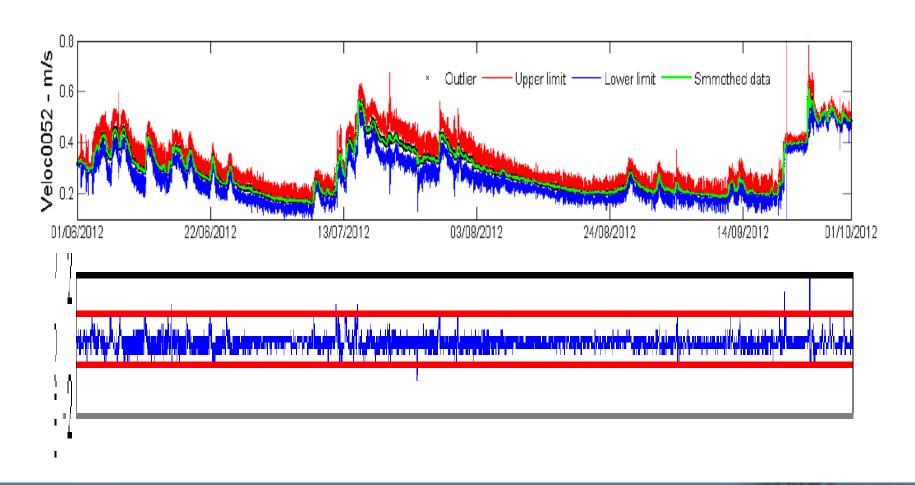
- Model-based forecast of expected data  $\hat{x}$
- Prediction interval

$$x_{\lim} = \hat{x} + K \cdot \hat{\sigma}_e$$





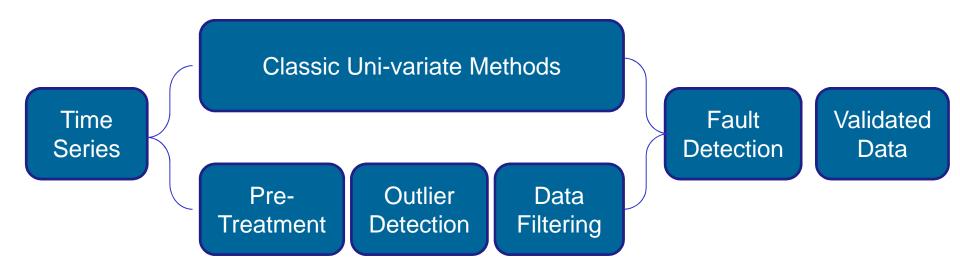
# Model-Based Method for Outlier Detection





# Combination of Methods

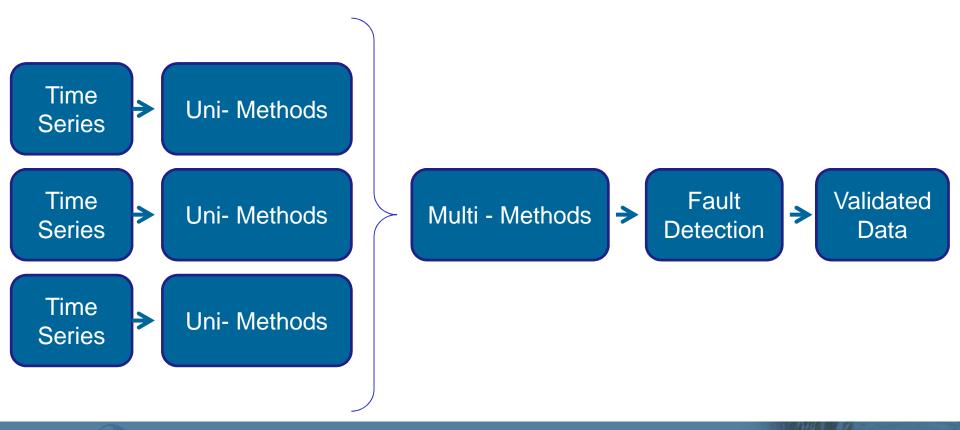
- PrecisionNow univariate analysis
  - Multi-step method combination





# Combination of Methods

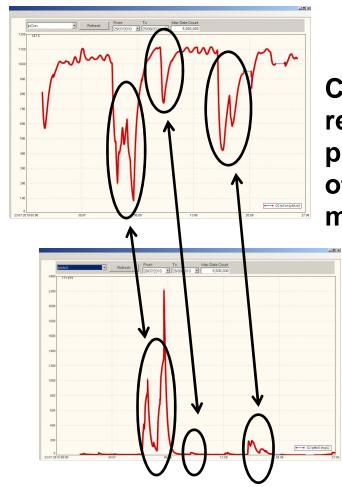
➤ Multivariate time series analysis





# Multivariate – Simple Case

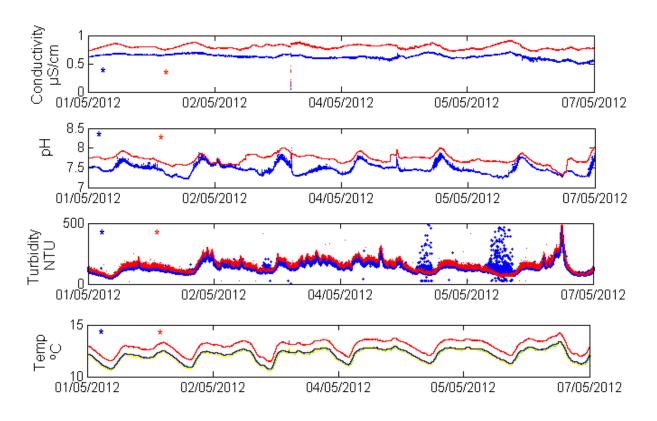
- Data from Quebec City: St Charles River
  - Conductivity vs TSS (data after LowPass Filter)
  - no alarm



Confirmation of real events as picked up by other measurements



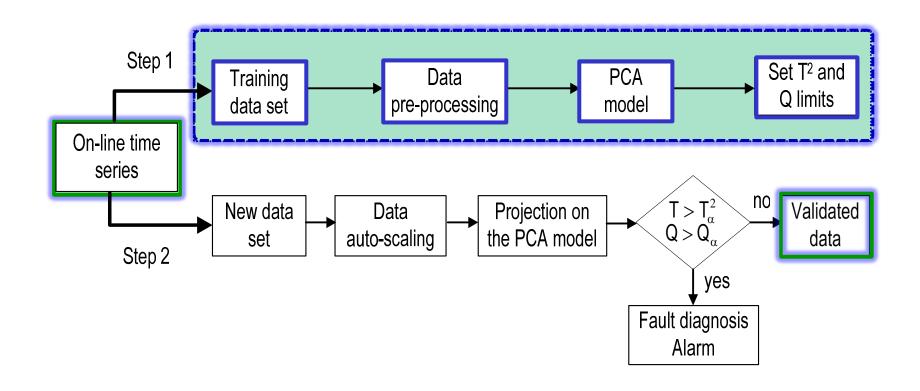
# Multivariate – PCA Approach



- Variable 20% bias
   (Cond<sub>1</sub>,Cond<sub>2</sub>)
- Variable bias (pH<sub>1</sub>, pH<sub>2</sub>), (Turb<sub>1</sub>, Turb<sub>2</sub>)
- Const. 5% bias
   (Temp<sub>1</sub>, Temp<sub>2</sub>)



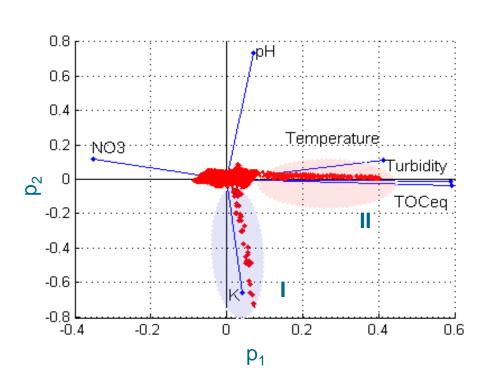
# Multivariate – PCA Approach



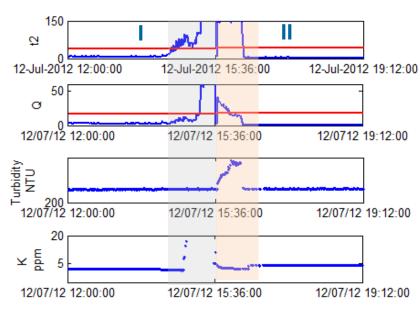


# Real-Time Data Modules – PCA

#### Data in the new space – 2 Components



#### Statistics period I and II





#### Conclusions

- > RSM30 / PrecisionNow
  - Easily deployed in various environments (WWTP, river,...)
  - Data logging
  - Customizable, real-time data evaluation capability
  - Sensor independent
  - Algorithms used as a stand-alone package (office) or in conjunction with an RSM30 (water's edge)



# Conclusions

#### >RSM30

 Easily shipped and deployed in various environments (WWTP, river,...)

# > PrecisionNow provides

- Data logging
- Customizable, real-time data evaluation capability
- Sensor independent
- Can be used as a stand-alone package (office) or in conjunction with an RSM30 (water's edge)



#### Conclusions

- Dealing with faulty sensors represents a challenge for effective WQ monitoring
- Real-time fault detection minimizes postprocessing effort, and maximizes response times
- ➤ Uni- and Multi-variate methods allow for the detection of multiple faults in real-time



# Acknowledgements









# Thank-you!



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